

**SCIENCE DATA REPOSITORIES (SDRs)
ON THE WEB:
*AN INITIAL SURVEY***

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Rationale

Study

Discussion

Future Work

OBJECTIVES

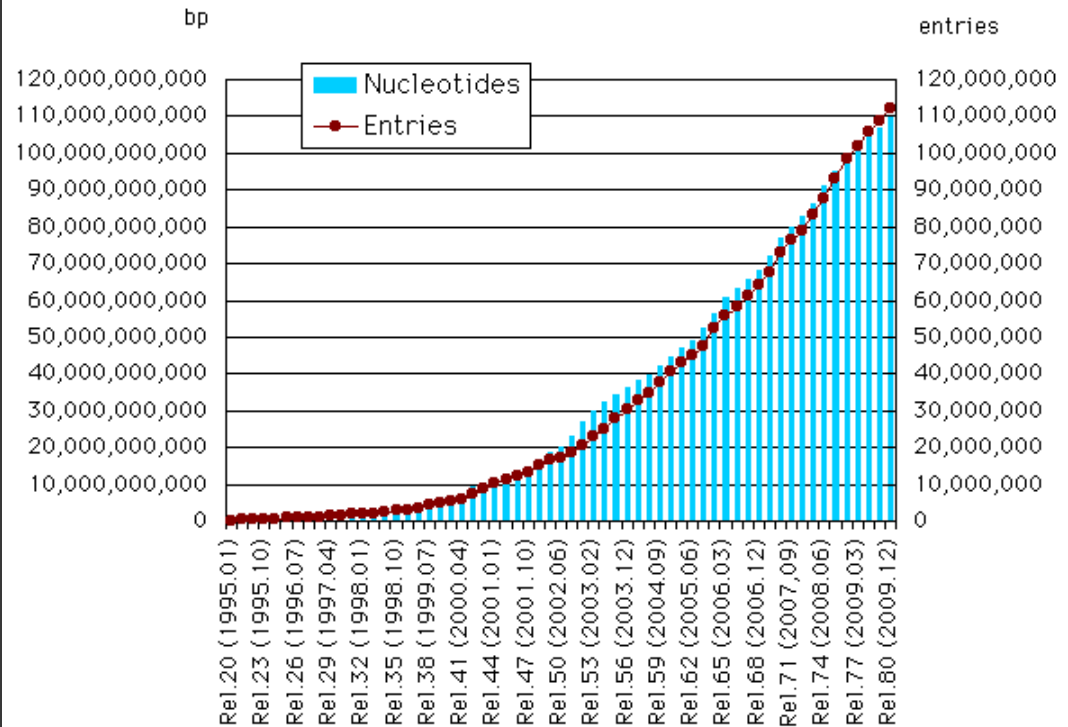
“Digital data collections are
powerful catalysts
for progress and for
democratization of the
research and the enterprise.”

National Science Board [NSB] Report 2005c

RATIONALE

Total
sequencing
contributions:
12,000,000,000
base pairs

DDBJ/EMBL/GenBank Database Growth



* Note : CON and TPA divisions are not counted in the Release

ORIGINS

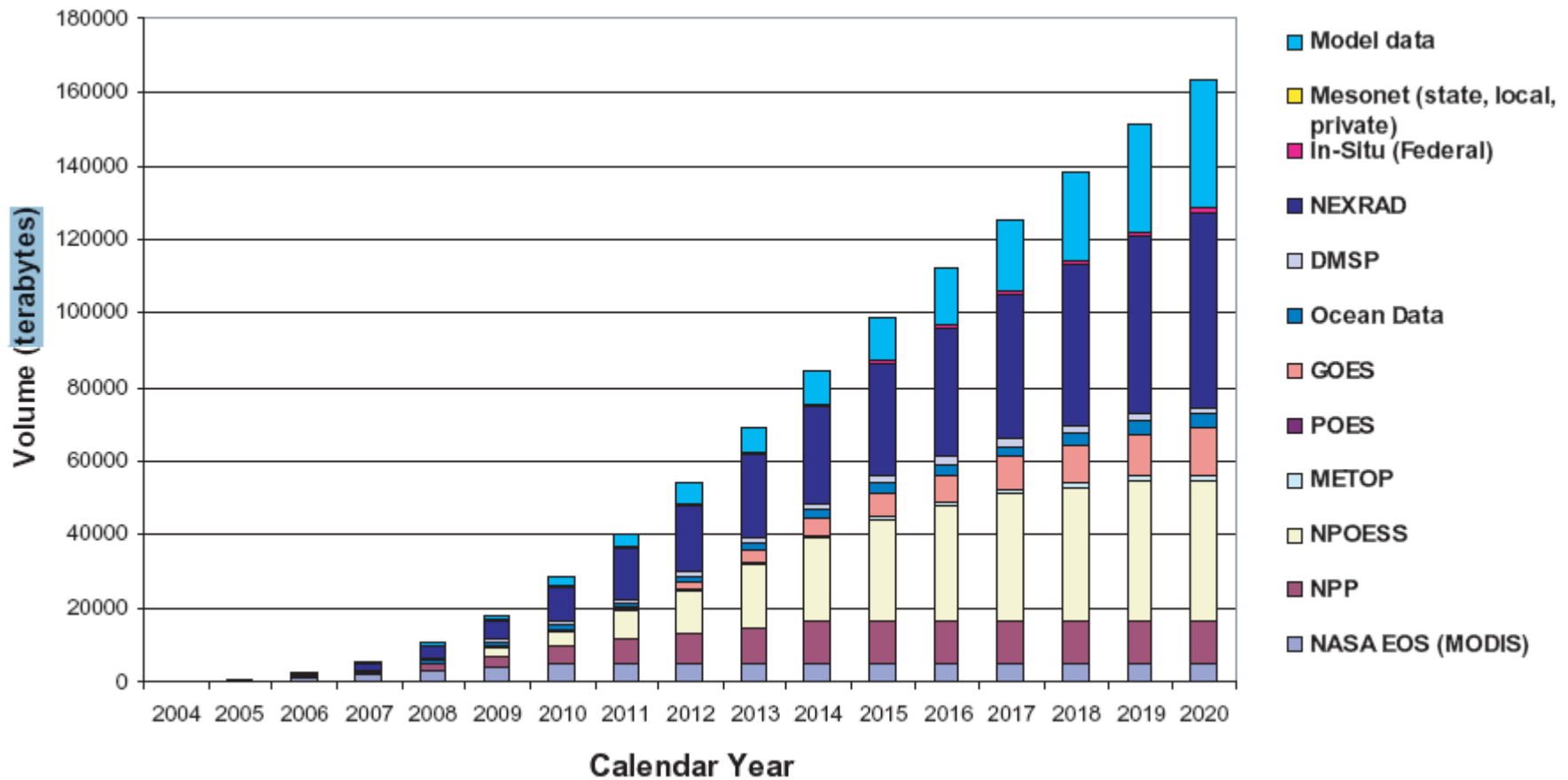
Sequencing Progress, Updated Hourly

Date(s)	Total Q20* Bases
3/5/2010: ABI3730	1.798 Million
Current month (3/2010)	.039 Billion
Last month (2/2010)	.289 Billion
FY to Date (10/1/2009-3/5/2010)	1.68 Billion
Total (3/1999-3/5/2010)	198.812 Billion

JGI generates on the order of 2.3 gigabases of sequence per month or 1 terabyte of data per month

Data from the Department of Energy's Joint Genome Institute

ORIGINS



NOAA: Large-array data growth expected over 15 years. Current estimates predict data archive growth to more than **160,000 TB by 2020.**

http://www.ngdc.noaa.gov/noaa_pubs/pdf/NOAA_DataManagementReport_Final.pdf

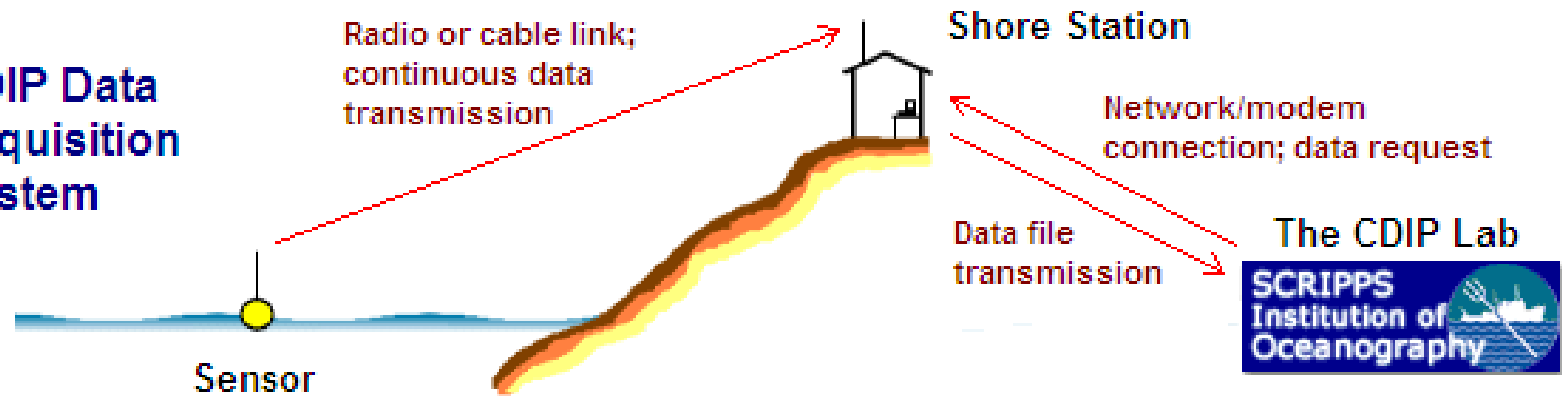
ORIGINS

Hubble
Space
Telescope:
generates 10
gigabytes of
data per day



ORIGINS

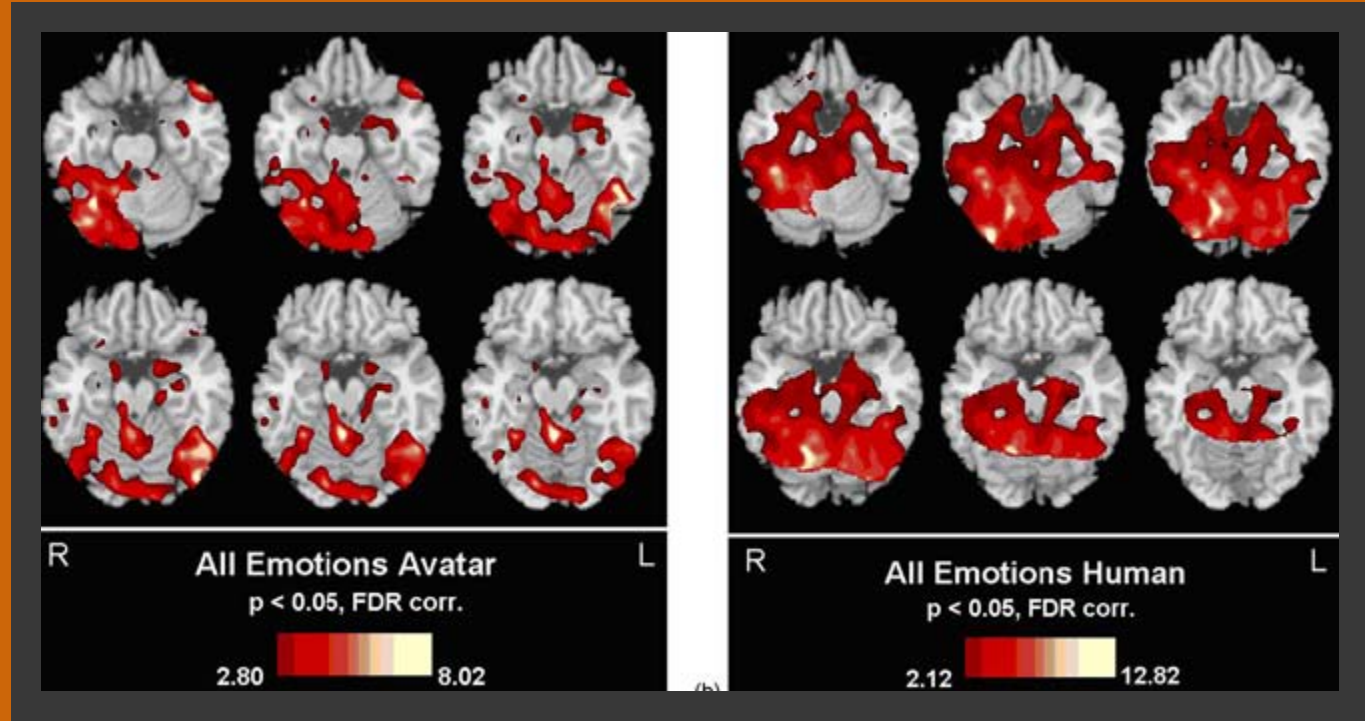
CDIP Data Acquisition System



Coastal Data Monitoring

ORIGINS

Functional Magnetic Resonance Imaging (fMRI)



Amygdala activation at 3T in response to human and avatar facial expressions of emotions.
<http://evolution.anthro.univie.ac.at/institutes/urbanethology/projects/simulation/fmri/index.html>

ORIGINS

So, what is happening with all of the Closed Circuit TV (CCTV) data generated every day?



ORIGINS

Clearly, we are entering the yottabyte
(YB) era:

1,000,000,000,000,000,000,000,000
(one septillion) bytes

GIZMODO

IPHONE APPS DIRECTORY

New York, 11:47 AM

Tue Mar 2

66 posts in the last 24
hours

FR | IT | DE | SP | JP | AU |
BR

GIZMODO TEAM

Tip Your Editors:
tips@gizmodo.com

Editorial Director:
Brian Lam | Email |

The NSA to Store a YOTTABYTE of Your Phone
Calls, Emails and Other Big Brothery Stuff

1,000,000,000,
000,000GB

In Utah, the National Security Agency is building a \$2 billion storage facility that will house and analyze all forms of electronic communication...a potential yottabyte of everyone's (formerly) personal data. So how big is a yottabyte? [CrunchGear](#) puts it well:

**At least many
thousands of SDRs**

**Often start as
government projects**

**Keys to success
are elusive**

**Highly
heterogeneous**

**Highly
domain specific**

RATIONALE

“I found it interesting to read your survey results and see what information you inferred about the KNB. It points out areas that we need to improve upon in terms of communication from our web presence.”

--Matt Jones, Knowledge Network for Biocomplexity

STUDY

Inventory a convenience
sample of 100 SDRs

Examine **commonalities**

Identify major
characteristics

Look for **trends** over time

Identify characteristics that
correlate with **success**

GOALS

In 2007-2008,
identified 100
SDRs through
Google searches

In 2009, site profiles were
sent to site administrators
for **review and comment**

2007

2008

2009

2010

Initial review was
done to **refine**
salient
characteristics

50 characteristics
were captured, **17 of**
which were
analyzed using
cluster analysis

TIMELINE

GENERAL

- Scientific Domain
- Research, Community or Reference
- Holding Size
- Information

BUSINESS

- Governmentally based
- Business Type
- Memberships or Subscriptions

DATA DETAILS

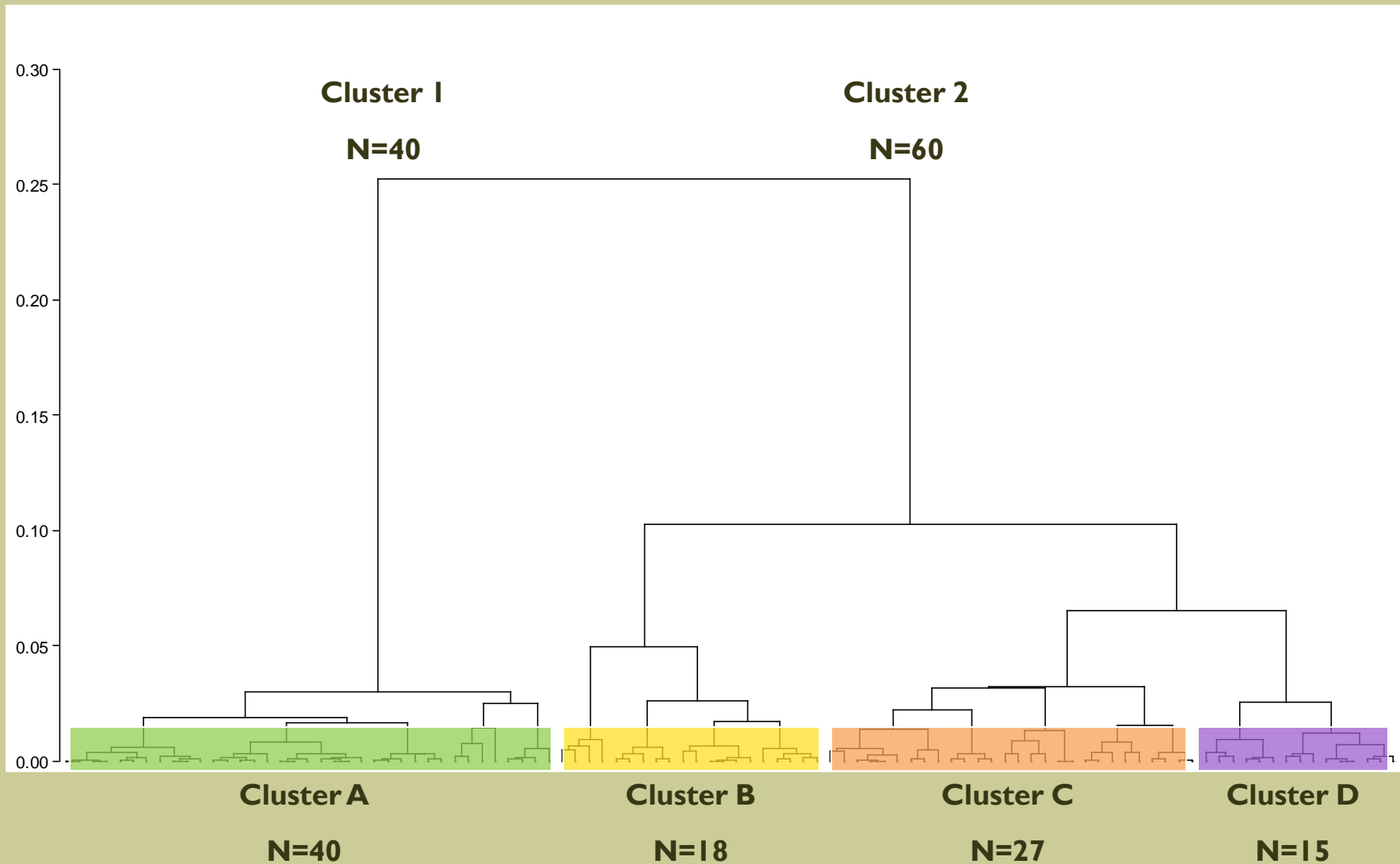
- Deposits and Access
- Representation
- Ingest Methods
- Metadata
- Preservation
- Additional Services
- Usage Statistics

CHARACTERISTICS of the 50

#	Characteristic	Type
1	Natural Science	Binary
2	Science Area	Nominal
3	Virtual	Binary
4	Holding Size	Ordinal
5	Research/Community/Reference	Nominal
6	Centralized/Distributed	Binary
7	Instrument Based	Binary
8	Business Type	Nominal
9	Subscription or Membership	Binary
10	How Based	Nominal
11	Multi-Sponsored	Binary
12	Grants & Contracts	Binary
13	Accept Submitted Data	Binary
14	Registration Required	Ordinal
15	Free in the Public Domain	Ordinal
16	Preservation Policy	Binary
17	Portal	Binary

The 17 characteristics suitable for analysis and their data type

ANALYSIS



CLUSTER RESULTS

Agency for Healthcare Quality and Research
Multimission Archive at STScI (MAST)
Alternative Fuels Data Center (AFDC)
NASA Langley Atmospheric Science Data Center
Atlantic Oceanographic and Meteorological Laboratory
(AOML) Environmental Data Server or ENVIDS
NASA/IPAC Infrared Science Archive (IRSA)
Atmospheric Radiation Monitoring (ARM) Data Centers
National Ecological Observatory Network (NEON)
Carbon Dioxide Information Analysis Center (CDIAC)
National Nuclear Data Center Nuclear Data Portal
Centers for Disease Control and Prevention Data and
Statistics
National Space Science Data Center
Climate and Environmental Retrieval and Archive
(CERA) for the WDCC
Natural Resource and GIS Metadata and Data Store of
the National Park Service
Chandra data archive
Oak Ridge National Laboratory Distributed Active
Archive Center (ORNL DAAC)
Comprehensive Epidemiological Data Resource (CEDR)
Planetary Data System (PDS)
Controlled Fusion Atomic Data Center (CFADC)
Renewable Resource Data Center (RReDC)

DNA Data Bank of Japan (DDBJ)
Solar Data Analysis Center (SDAC) at NASA Goddard
Space Flight Center
DOE Joint Genome Institute's (JGI) Genome Web Portal
SkyView
DOE's Energy Information Administration (EIA)
Smithsonian Tropical Research Institute's (STRI) Center
for Tropical Forest Science (CTFS)
European Southern Observatory (ESO) Archive Facility
U.S. Transuranium and Uranium Registries (USTUR)
Genbank
United States Census Bureau
Geodata.gov
US National Virtual Observatory (NVO)
NASA's High Energy Astrophysics Science Archive
Research Center (HEASARC)
US Transplant -- Scientific Registry of Transplant
Recipients
HubbleSite Gallery
Visible Human Project®
NOAA's Integrated Coral Observing Network (ICON)
World Data Center (WDC)
Integrated Monitoring Network
World Data Center (WDC) for Biodiversity and Ecology

CLUSTER A

BioSystematic Database of World
Diptera (BDWD)
CalSurv, the California Vectorborne
Disease Surveillance System
Ecological Society of America's
Ecological Archives
European Molecular Biology Laboratory
- European Bioinformatics Institute or
EMBL-EBI
Encyclopedia of Astronomy and
Astrophysics
Ensembl
International Council for Science :
Committee on Data for Science and

Technology
Iubio
J. Craig Venter Institute
Jaspar
Journal of Applied Econometrics (JAE)
Data Archive
National Center for Ecological Analysis
and Synthesis (NCEAS) Data
Repository
NC One Map
Spec Patterns
The BioGRID
The Sanger Institute

CLUSTER B

ACE Science Center (ASC)
Antarctic Glaciological Data Center (AGDC)
Astronomy Digital Image Library
Brain biodiversity bank at Michigan State
University
Bugwood Network
Center for International Earth Science
Information Network (CIESIN)
Chesapeake Bay Environmental Observatory
(CBEO) Portal
Coastal Data Information Program (CDIP) of
the Scripps Institution of Oceanography,
University of California at San Diego
Cornell University Geospatial Information
Repository
Forestry Images
Henry A. Murray Research Archive (MRA)
IAU Minor Planet Center
Inter-university Consortium for Political and
Social Research (ICPSR)
IQSS Dataverse network
LTER Network
McIDAS

Melanoma Molecular Map Project
Repository for Archiving, Managing and
Accessing Diverse Data (RAMADDA)
Socioeconomic Data and Applications Center
(SEDAC)
Space Science and Engineering Center (SSEC)
Data Center, University of Wisconsin-Madison
The Howard W. Odum Institute for Research in
Social Science
The USA National Phenology Network (USA-
NPN)
Thematic Realtime Environmental Distributed
Data Services (THREDDS) Data Server
Unidata Program at the University Corporation
for Atmospheric Research (UCAR)
University of California Santa Cruz Genome
Bioinformatics
Woods Hole Oceanographic Institute Data
Center
World Data Center for Human Interactions in
the Environment

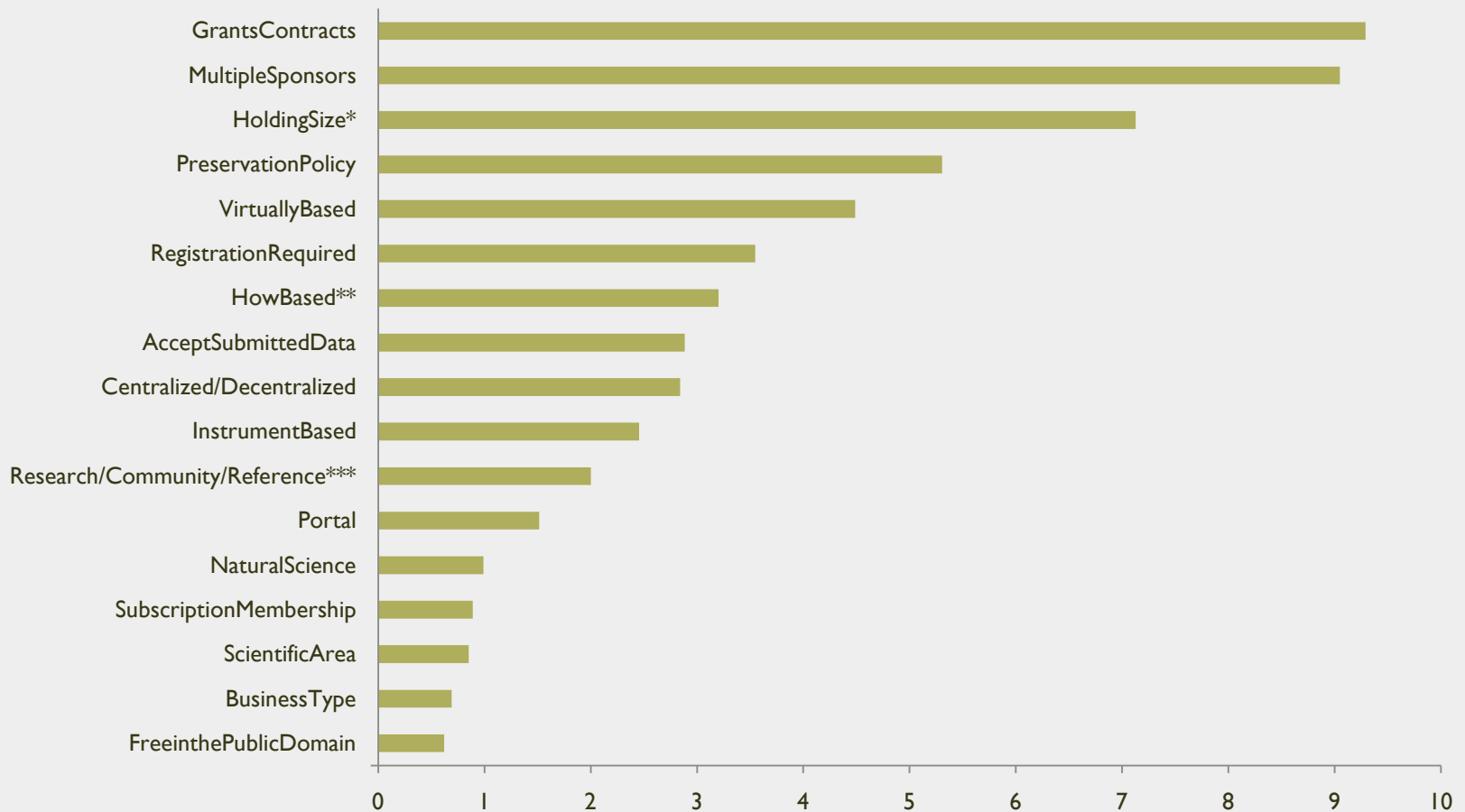
CLUSTER C

Amphibian Ark Team Portal
Discover Life in America's Great Smoky Mountains National Park's All Taxa
Biodiversity Inventory
Encyclopedia of Life
fMRI Data Center
Global Biodiversity Information Facility
Knowledge Network for Biocomplexity (KNB)
Mouse Genome Informatics
NEEScentral
Netlib
Ocean Biogeographic Information System (OBIS)
Paleobiology Database
PANGAEA® - Publishing Network for Geoscientific and Environmental Data
Tree of Life Web Project
Treebase, Treebase2
VegBank, a vegetation plot database

CLUSTER D

Relative contribution of variables

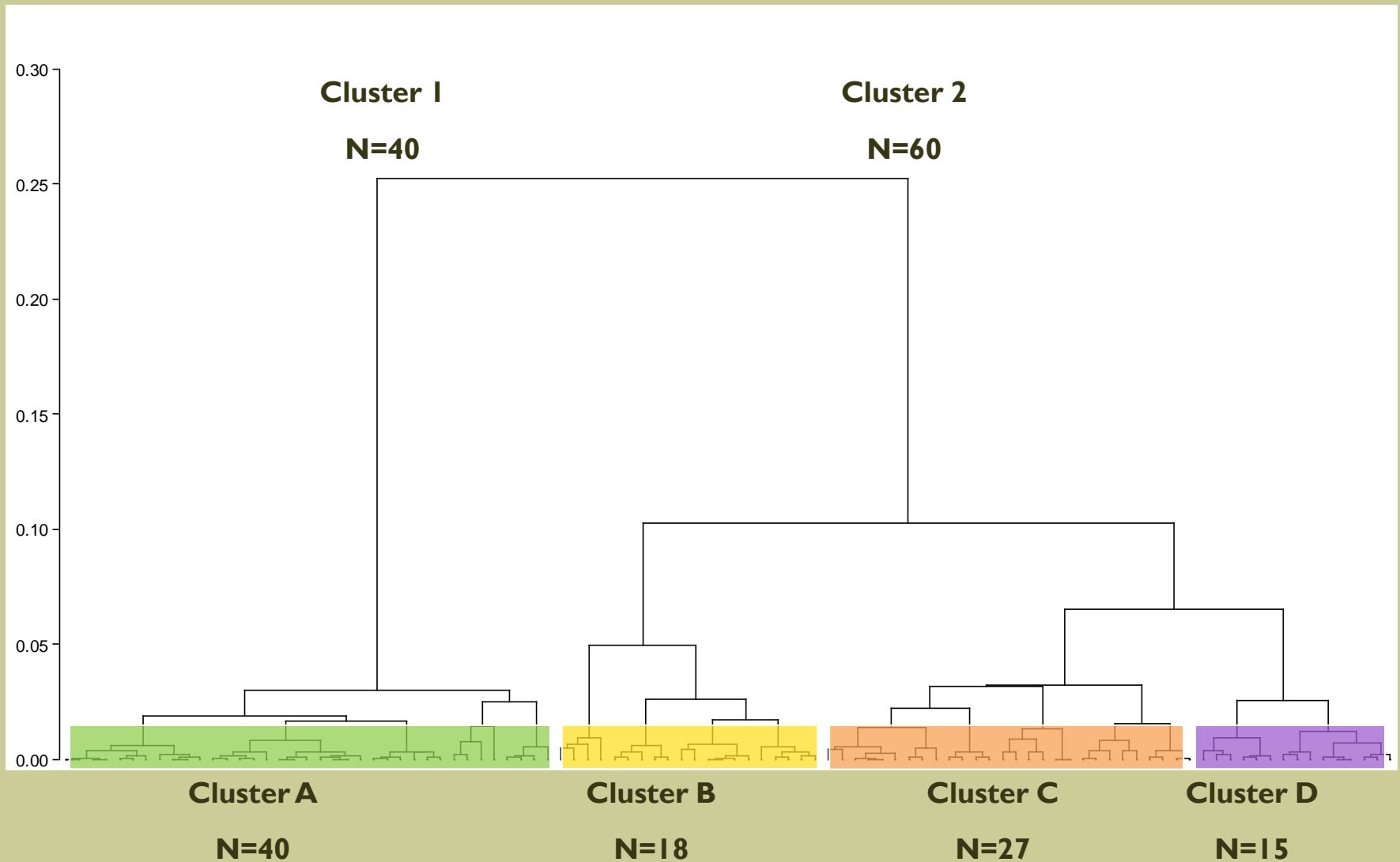
(measured using simple logistic regression Wald Chi-Square/df)



LOGISTIC REGRESSION

Variables	Cluster A: 'Governmental'	Cluster B: 'Medicine/Small'	Cluster C: 'University'	Cluster D: Community 'Biology'
Grants Contracts	No	Mixed	Yes	Yes
Multiple Sponsors	No	Yes	Yes	Mixed
Holding Size	Large	Small	Mixed	Moderate
Preservation Policy	Yes	Mixed	Yes	No
Virtually Based	No	Mixed	No	No
Registration Required	No	No	Mixed	No
How Based	Governmental	Mixed	University	Mixed
Accept Submitted Data	Mixed	Yes	Yes	Yes
Centralized/Distributed	Mixed	Mixed	mixed	Distributed
Instrument Based	Mixed	No	No	No
Res/Com/Ref	Research	Mixed	Research	Community
Portal	Mixed	No	mixed	Mixed
Natural Science	Yes	Yes	Yes	Yes
Subscription Membership	No	No	No	No
Scientific Area	Mixed	Medicine	Mixed	Biology
Business Type	Federal Center	Mixed	University	Partnership
Free in the Public Domain	Yes	Yes	Yes	Yes

GROUP COMPOSITION

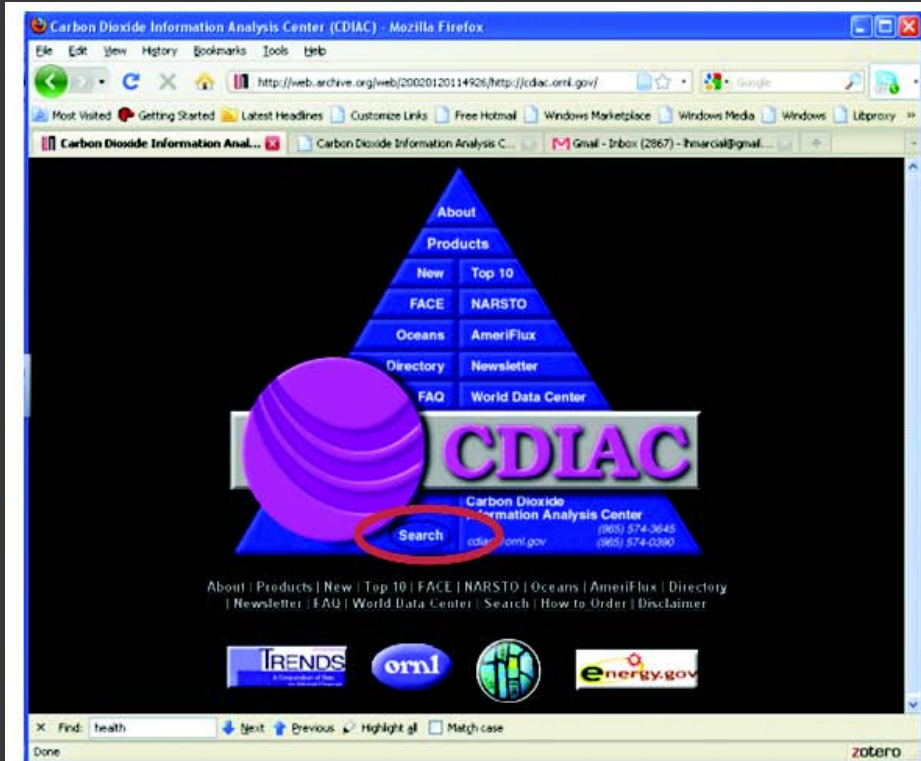


CLUSTER RESULTS

If we are all about studying success
and
SUCCESS = performance over time

How can we study SDRs over time?

ALTERNATIVE SAMPLING



WAYBACK MACHINE

“I am interested in your preservation policy line. We don't have a policy explicitly listed, though we do hope and aim to make the data permanently preserved. Could you provide me with some examples of preservation policies so that we might create one?”

--Michael Lee, VegBank

DISCUSSION

Preservation any mention of
Policy = long term data
storage

Although preservation ranked as the fourth most important variable (taken independently) in defining group membership, what we did not find was at least as important as what we did.

PRESERVATION

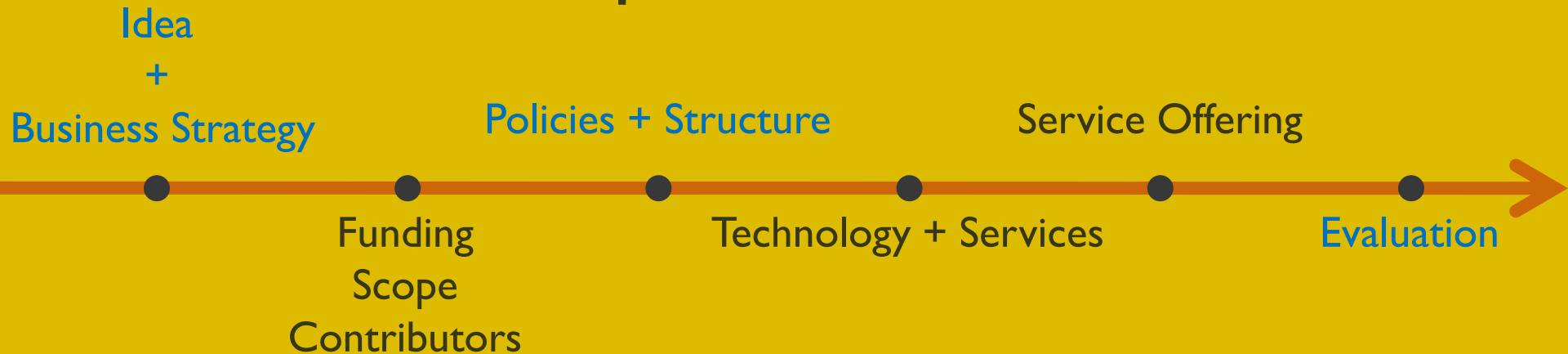
<u>Title</u>	<u>Principal Investigator</u>	<u>State</u>	<u>Organization</u>	<u>Awarded Amount to Date</u>
Support for an International Workshop on Scientific Collections held in Brussels	Schindel, David	VA	Smithsonian Institution	\$24,000.00
Workshop Proposal: IMAG Futures Meeting	Schlick, Tamar	NY	New York University	\$10,000.00
A Feasibility Study for a National Science Foundation Open-Access Publication Repository	Choudhury, Golam	MD	Johns Hopkins University	\$299,688.00
DataNet Full Proposal: DataNetONE (Observation Network for Earth)	Michener, William	NM	University of New Mexico	\$12,258,110.00
DataNet Full Proposal: The Data Conservancy (A Digital Research and Curation Virtual Organization)	Choudhury, Golam	MD	Johns Hopkins University	\$3,726,890.00
4th International Conference on Open Repositories, 2009	Walters, Tyler	GA	GA Tech Research Corporation - GA Institute of Technology	\$15,000.00
SCI: TeraGrid Resource Partner	Towns, John	IL	University of Illinois at Urbana-Champaign	\$32,441,949.00

DATANET

Emerging environments (observed) pattern:



Mature environments pattern:



EVOLUTION/ECOLOGY

Research: products of one or more focused research projects and typically contain data that are subject to limited processing or curation. These collections are generally small and/or project specific.

Community data collections: serve a single science or engineering community. They are generally intermediate in size and supported in a somewhat more distributed fashion by the community served.

Reference data collections: serve large segments of the scientific and education community. These are generally broad and/or multidisciplinary as well as long lived.

ATYPOLOGY



FRAMEWORK

Characteristic	Institutional Repository	Science Data Repository
Holdings Management	IRs have a high degree of similarity in terms of management of holdings.	SDRs are dissimilar, often highly domain specific, to each other in terms of holdings.
Handling Procedures	Homogeneity of handling procedures both within and among repositories (DRIVER, 2008)	Heterogeneity of handling procedures, perhaps necessary to degree of specialization within a domain, often seemingly due to lack of standardization.
Base	Institutionally based (DRIVER, 2008)	Typically domain based, though increasingly cross cutting making the call for standardization more critical.

ENVIRONMENT

Characteristics of Success/Group Composition

DRIVER (2008):

- Business of digital repositories,
- Stimuli for depositing materials into repositories, intellectual property rights,
- Data curation, and
- Long-term preservation

SDRs:

- *GrantsContracts*
- *MultipleSponsors*
- *HoldingSize*
- *PreservationPolicy*

SUCCESS

“The format of this form forces us to pigeonhole ourselves in a way that is not accurate or useful. Sorry I can't be of more help.”

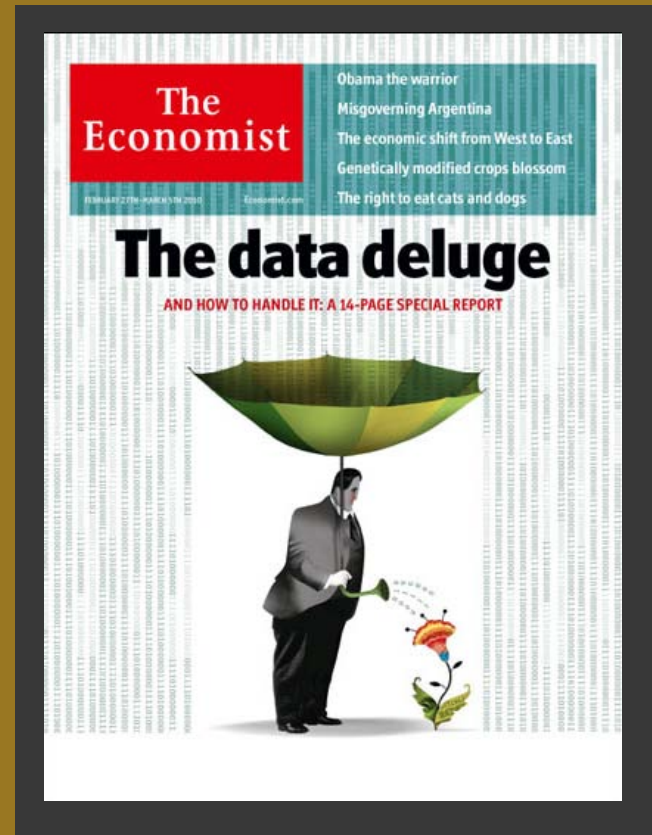
--Matthew LaPoint, J. Craig Venter Institute

FUTURE WORK

Looking back, the key to
moving ahead is

**LONGITUDINAL
EVALUATION**

FUTURE WORK



GETTING THE WORD OUT

QUESTIONS?

THANK YOU!